

Unsupervised Learning

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Places where you will see unsupervised learning

- ▶ It can be used to segment the market based on customer preferences.
- ▶ A data science team reduces the number of dimensions in a large dataset to simplify modeling and reduce file size.

REQUIREMENTS: A predefined notion of similarity/dissimilarity.

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Examples:

Market Segmentation: Customers with similar preferences in the same groups. This would aid in targeted marketing.

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where $|C_i|$ is the number of points in C_i

Then,

$$\begin{aligned} WCV(C_i) &= \frac{1}{|C_i|} \sum_{a \in C_i} \sum_{b \in C_i} \|x_a - x_b\|_2^2 \\ &= 2 \sum_{a \in C_i} \|x_a - x_i\|_2^2 \end{aligned}$$

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This shows that K-Means gives the **local minima**.

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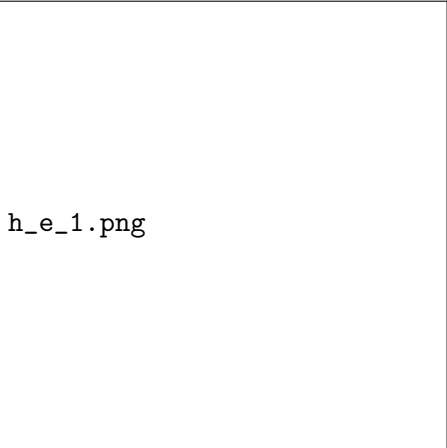
k_bad_1.png

k_bad_2.png

Examples where K-Means fails

Algorithm for Hierarchical Clustering

1. Start with all points in a single cluster



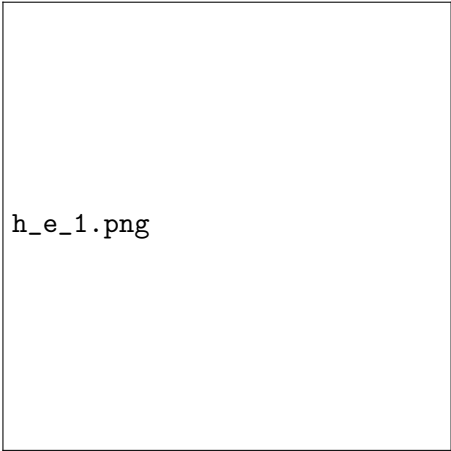
h_e_1.png

Example Dataset

Algorithm for Hierarchical Clustering

1. Start with all points in a single cluster

- 2.1 Identify the 2 closest points



h_e_1.png

Example Dataset

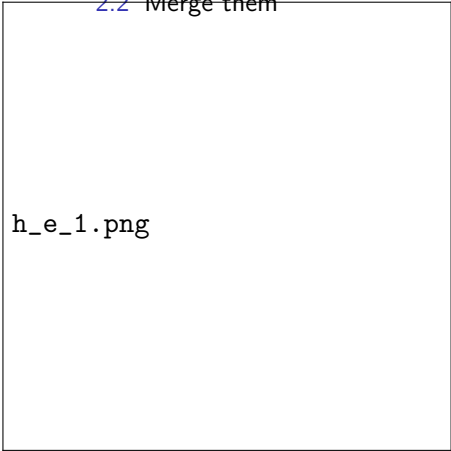
Algorithm for Hierarchical Clustering

1. Start with all points in a single cluster

2.1 Identify the 2 closest points

2.2 Merge them

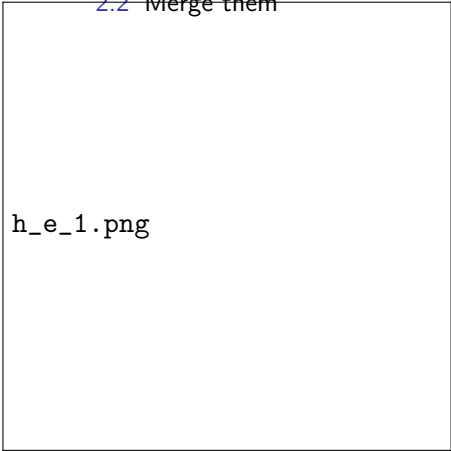
h_e_1.png



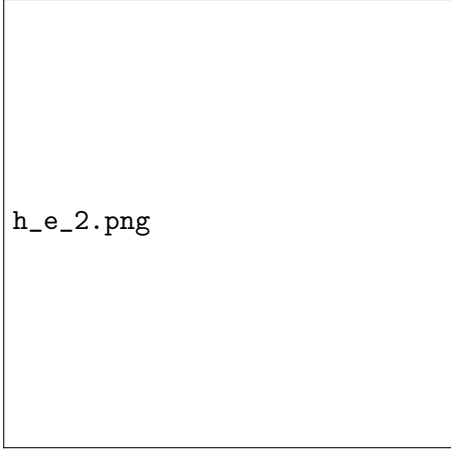
Example Dataset

Algorithm for Hierarchical Clustering

1. Start with all points in a single cluster
2. Repeat until all points are in a single cluster
 - 2.1 Identify the 2 closest points
 - 2.2 Merge them



h_e_1.png



h_e_2.png

Example Dataset

Final Clustering

Joining Clusters/Linkages

Complete

Max inter-cluster
similarity

Single

Min inter-cluster
similarity

Centroid

Dissimilarity between
cluster centroids

More Code

[Google Colab Link](#)